

## Iterative and recursive estimators for hidden Markov errors-in-variables models

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### **Abstract:**

In this paper we propose maximum-likelihood (ML) estimation of errors in variables models with finite-state Markovian disturbances. Such models have applications in econometrics, speech processing, communication systems, and neurobiological signal processing. We derive the maximum likelihood (ML) model estimates using the expectation maximization (EM) algorithm. Then two recursive or "on-line" estimation schemes are derived for estimating such models. The first on-line algorithm is based on the EM algorithm and uses stochastic approximations to maximize the Kullback-Leibler (KL) information measure. The second on-line algorithm we propose is a gradient-based scheme and uses stochastic approximations to maximize the log likelihood.

### **Index Terms:**

error statistics hidden Markov models iterative methods maximum likelihood estimation recursive estimation signal processing Kullback-Leibler information measure applications communication systems econometrics expectation maximization algorithm finite-state Markovian disturbances gradient-based scheme hidden Markov errors-in-variables models iterative estimators log likelihood maximum-likelihood estimation neurobiological signal processing on-line algorithm on-line estimation schemes recursive estimators speech processing stochastic approximations

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### **Reference list:**

- 1, D. Ghosh, "Maximum likelihood estimation of the dynamic shock-error model", *J. Econometrics*, vol.41, pp.121-143, 1989.
- 2, J. D. Hamilton, "A new approach to the economic analysis of nonstationary time series and the business cycle", *Econometrica*, vol.57, no.2, pp.357-384, 1989.
- 3, S. E. Levinson, L. R. Rabiner, M. M Sondhi, "An introduction to the theory of probabilistic functions of a Markov process to automatic speech recognition", *Bell Syst. Technol. J.*, vol.62, no.4, Apr. 1983.
- 4, S. H. Chung, V. Krishnamurthy, J. B. Moore, "Adaptive processing techniques based on hidden Markov models for characterizing very small channel currents buried in noise and deterministic interferences", *Philosoph. Trans. Royal Soc.*,

pp.357-384, 1991.

5, I. B. Collings, V. Krishnamurthy, J. B. Moore, "On-line identification of hidden Markov models via recursive prediction error techniques", *IEEE Trans. Signal Processing*, vol.42, no.12, pp.3535-3539, Dec. 1994.  
[Abstract] [PDF Full-Text (420KB)]

6, A. P. Dempster, N. M. Laird, D. B. Rubin, "Maximum likelihood from incomplete data via the EM algorithm", *J. Royal Stat. Soc.*, vol.6, pp.1-38, 1977.

7, D. M. Titterton, A. F. M. Smith, U. E. Makov, "Statistical analysis of finite mixture distributions", *Wiley Series in Prob. and Math. Stat.*, 1985.

8, V. Krishnamurthy, J. B. Moore, "On-line estimation of hidden Markov parameters based on the Kullback&ndash;Leibler information measure", *IEEE Trans. Signal Processing*, vol.41, no.8, pp.2557-2573, Aug. 1993.  
[Abstract] [PDF Full-Text (1112KB)]

9, E. Weinstein, A. V. Oppenheim, M. Feder, J. R. Buck, "Iterative and sequential algorithms for multisensor signal enhancement", *IEEE Trans. Signal Processing*, vol.42, no.4, pp.846-859, Apr. 1994.  
[Abstract] [PDF Full-Text (1000KB)]

10, J. A. Fessler, A. O. Hero, "Space-alternative generalized expectation&mdash;maximization algorithm", *IEEE Trans. Signal Processing*, vol.42, no.10, pp.2664-2677, Oct. 1994.  
[Abstract] [PDF Full-Text (1140KB)]

11, B. T. Polyak, A. B. Juditsky, "Acceleration of stochastic approximation by averaging", *SIAM J. Contr. Optim.*, vol.30, no.4, pp.838-855, July 1992.

12, L. Ljung, "System Identification: Theory for the User.", *Prentice-Hall*, Englewood Cliffs, NJ, 1987.

13, X. L. Meng, D. B. Rubin, "Maximum likelihood estimation via the ECM algorithm: a general framework", *Biometrika*, vol.80, no.2, pp.267-278, 1993.

14, X. L. Meng, "On the rate of convergence of the ECM algorithm", *Annals Stat.*, vol.22, no.1, pp.326-339, 1994.

15, C. Liu, D. B. Rubin, "The ECME algorithm: a simple extension of EM and ECM with faster monotone convergence", *Biometrika*, vol.81, no.4, pp.633-648, 1994.